Employee Data Analysis Report

1. Dataset Description

1.1 Source: HR Analytics dataset (1,000 records).

1.2 Columns:

- EmpID (string) Employee ID, a unique identifier for each employee.
- o Age (integer) Age of the employee.
- o Department (string) Department in which the employee works.
- o JobRole (string) Role or position in the job.
- o MonthlyIncome (double) Monthly income of the employee.
- o Attrition (string) Employee attrition status (e.g., Yes or No).
- o PerformanceRating (double) Performance rating of the employee.

1.3 Data Quality:

- o Schema inferred correctly; all columns present as expected.
- No explicit null/missing-value handling in notebook; basic exploration and previews performed.
- Types are consistent with intended use (IDs categorical, incomes numeric, ratings numeric).

2. Operations Performed

2.1 Data Cleaning & Exploration

- o Loaded CSV into Spark DataFrame; previewed first rows; printed schema.
- o Distinct counts: employees and departments; listed department names.
- Wrote filtered dataset to disk for Age > 45.

2.2 Descriptive Analytics

- Departmental employee count (pie chart): R&D 961 (65.4%), Sales 446 (30.3%), HR 63 (4.3%).
- Salary & Age distribution analysis (histogram, boxplots): MonthlyIncome is right-skewed with outliers up to \sim 20k; ages span from 18 with a notable 45+ segment.

2.3 Relationship Analysis

- Visualized Attrition counts by Department.
- o Visualized MonthlyIncome distribution (histogram and boxplot).
- Visualized average PerformanceRating by JobRole.
- o Applied a business rule transformation: +\$500 to MonthlyIncome for employees with Age > 45 (for scenario analysis); inspected samples.

3. Key Insights

3.1 Workforce Demographics

- Organization size: 1,470 employees.
- Age spans include young entrants (example at 18) and a notable segment over 45 (extracted subset analyzed/saved)

3.2 Departmental Insights

- Research & Development is the largest unit (961 employees), followed by Sales (446); Human Resources is comparatively small (63).
- Attrition visualization created to compare departmental patterns (no numeric rates computed in-notebook).

3.3 Salary Insights

- Highest average incomes by role are in leadership: Managers (~17182) and Research Directors (~16034).
- Individual departments show wide salary ranges, with R&D exhibiting the broadest span (1009 to 19999).
- Several individual contributor roles (e.g., Research Scientist, Laboratory Technician, Sales Representative) have substantially lower average incomes.

4. Recommendations

4.1 Talent Development & Retention

- Use the attrition-by-department view to prioritize targeted retention programs; compute attrition rates next to identify hotspots.
- For roles with lower pay bands and stable performance (e.g., Lab Technician, Research Scientist), strengthen career pathways and upskilling to improve engagement.

4.2 Compensation Strategy

- o Review pay structure for lower-paying roles relative to contribution and market, especially in Sales Representative and entry-level R&D roles.
- o Monitor pay compression among top roles (Managers, Research Directors) and ensure performance-based differentiation is preserved.

4.3 Workforce Allocation

- o Given R&D's size, assess workload distribution, managerial span of control, and support staffing to avoid bottlenecks.
- Evaluate whether HR headcount adequately supports organizational scale and needs.

4.4 Geographic Operations

Add location attributes (country, region, city/site)
to enable geographic analyses (pay parity, local attrition, hiring funnels)
in future cycles

4.5 Future Analytics Opportunities

- o Compute and track attrition rates by department/role/tenure; perform cohort and survival analyses.
- o Incorporate additional drivers (tenure, education, overtime, training hours, promotions) and build predictive models for attrition risk.